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The Cost of Efficiency

When children learn how to tie their shoelaces, they do so in discrete steps — making a loop or tugging at the lace. Through repetition, these individual motions merge into elemental actions called “chunks” that remain so organized even after extensive practice.

Movement chunking, as the phenomenon is known, is a strategy that reduces long strings of information into shorter, more manageable pieces that are easier to remember. Scientists know that for people with Parkinson’s disease, Huntington’s disease and stroke, this movement chunking is severely disrupted. Understanding chunking and how it works is crucial for early diagnosis, treatment and rehabilitation therapy. Yet, science has no concrete explanation for it.

But now, a group of researchers, including UC Santa Barbara neurologist Scott Grafton, has developed a comprehensive theory for why chunking occurs. The research frames chunking as an economic tradeoff in the motor system, where merging small chunks becomes optimally “cost-effective” at certain learning stages. The findings appear in the journal Nature Communications.

“The nervous system aims to produce movements as efficiently as possible,” explained Grafton, a professor in the Department of Psychological & Brain Sciences and director of the campus’s Brain Imaging Center. “However, there is a computational cost to calculating efficient trajectories. The sweet spot between these goals results in chunks.”
The research team used tools of computational motor control, which produce computer models to discover how the brain controls limbs and the goals and constraints of the motor system. In this context, researchers have had difficulty explaining how humans and other animals transition from computationally simple but inefficient movements to computationally demanding but efficient ones.

“Our study resolves this difficulty by showing — theoretically and experimentally — that the most cost-effective complexity-efficiency learning paths are the ones that produce chunking,” said Grafton, who is also co-director of the Institute for Collaborative Biotechnologies. “Therefore, chunking is the natural byproduct of a clever strategy that minimizes learning costs.”

The investigators measured how rhesus macaques produced movement sequences over several days of practice and found that these animals are indeed cost-effective learners. By selecting when to meld chunks together in an intelligent way, the monkeys achieved savings on the cumulative costs of learning. They divided the movement sequence into chunks, optimized for efficiency within chunks and then merged chunks only when further gains in efficiency were required.

“Movement chunking has been extensively characterized in health and disease across humans and animals, but until now, a normative theory was lacking,” said Grafton, “Our theory derives optimal movement trajectories, and these experiments in which monkeys learn to produce a novel sequence of movements over an extended period of time demonstrate that our theory explains the essential features of the chunks that emerge in their movements.”

Framing the chunking phenomenon as an economic tradeoff offers a fresh perspective on motor learning and its disorders. For example, the irregular nature of movements post-stroke may be attributed to lower computational budgets for motor learning, and the inefficient movements seen in stroke may thus be adaptive to these budgets, Grafton explained. Any rehabilitation approach could benefit from this insight, he noted.

“Our computational perspective on chunking also opens up new questions regarding how the brain controls movements,” Grafton said. “In particular, recent evidence for the neural coding of chunking in the brain must be re-examined in the light of computational theories. Are neurons coding kinematic decisions, computational budgets or efficiency goals? These are broad open questions for the entire field of
motor control.”

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